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Potential Applications of Using Noninvasive Biomarkers to Predict Athletic Performance

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Abstract

This study explores the potential applications of noninvasive biomarkers in predicting athletic performance and their relevance to other fields such as agriculture and climate science. It discusses the impact of climate change on global food security, focusing on the challenges faced by agricultural systems in adapting to changing environmental conditions. It also examines the potential use of noninvasive biomarkers in agriculture to monitor plant health and predict crop yields, as well as their role in climate science to study the physiological responses of organisms to changing environmental conditions. The study further discusses various factors contributing to food insecurity, such as extreme weather events, shifting growing seasons, and water scarcity. It examines the importance of sustainable agricultural practices and technological innovations in mitigating the effects of climate change on food production. Furthermore, it highlights the need for international cooperation and policy interventions to address complex issues surrounding food security in the face of a changing climate. Overall, this study emphasizes the urgency of proactive measures to ensure food security for future generations in a rapidly changing world.

Keywords: *Noninvasive, Biomarkers, Athletic Performance.*

Introduction

Non-invasive biomarkers have emerged as valuable tools for predicting athletic performance by offering insights into various physiological and biochemical states without the need for invasive procedures. These biomarkers, sourced from blood, saliva, sweat, and digital data, enable monitoring of hydration status, cardiovascular health, musculoskeletal health, oxidative stress, and overall physical fitness. For instance, biomarkers in blood can indicate the level of oxygen-carrying capacity, while those in saliva can reflect the body's stress response. Incorporating technologies such as genomics, transcriptomics, and metabolomics enhances the predictive capabilities of these

biomarkers, while machine learning algorithms facilitate the analysis of multidimensional data for personalized health monitoring. The integration of noninvasive biomarkers in sports medicine not only holds promise for enhancing athletic performance but also plays a crucial role in injury prevention and overall well-being of athletes. Furthermore, continuous advancements in wearable technology have revolutionized the field by allowing real-time monitoring of these biomarkers during training sessions and competitions, providing coaches and athletes with valuable insights for optimizing performance and recovery strategies. Moreover, the utilization of artificial intelligence in conjunction with wearable technology has opened new possibilities for creating personalized training programs based on real-time data analysis, further pushing the boundaries of sports medicine and performance optimization. This integration of AI with wearable technology enables the development of predictive models that can anticipate potential injuries or performance

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plateaus, allowing for proactive adjustments to training regimens and reducing the risk of setbacks in athletes. By leveraging this technology, athletes can not only track their physical exertion levels, but also monitor vital signs and physiological responses in a comprehensive manner, leading to more informed decision-making and enhanced overall performance outcomes. Moreover, the use of AI in conjunction with wearable technology facilitates the collection and analysis of vast amounts of data, providing valuable insights into individualized training needs and recovery patterns that were previously inaccessible. This data-driven approach revolutionizes how athletes optimize their training routines and tailor their recovery strategies to maximize their athletic potential and minimize the likelihood of overtraining or burnout. Furthermore, the integration of AI algorithms can also predict potential injury risks based on gathered data, allowing athletes to proactively adjust their training regimens and prevent setbacks before they occur. By leveraging AI predictions of injury risks, athletes can make informed decisions to prioritize injury prevention strategies and maintain peak performance levels throughout their training cycles. In addition, the utilization of AI algorithms enables athletes to identify specific areas of weakness or imbalance in their physical conditioning, facilitating targeted interventions to address these vulnerabilities and enhancing overall performance outcomes.

Background

The field of sports medicine has long been interested in identifying biomarkers that can predict athlete fitness and playing ability. Recent studies have highlighted the potential of certain biomarkers, such as lactate and creatine kinase, to accurately predict an athlete's performance level and potential for injury. Therefore, athletes and coaches must monitor these biomarkers regularly to gain insight into their physical condition and optimize training regimens accordingly.

Topic Importance

Understanding biomarkers that predict an athlete's fitness and playing ability is crucial for optimizing training and improving performance. In conclusion, the ability to identify and assess these biomarkers may play a vital role in an athlete's development and success. Furthermore, timely intervention and personalized training programs can be implemented based on the biomarker assessment results, leading to optimized athletic performance and injury prevention. In addition to personalized training programs, nutritional guidance tailored to individual

biomarker assessments can enhance athletic performance and reduce injury risk. The Existing Knowledge from previous studies has identified several biomarkers associated with athletic performance, including lactate, creatine kinase, and cortisol. New knowledge: Further research is needed to fully understand the relationship between these biomarkers and athletic performance and identify additional biomarkers that may be useful in predicting and optimizing athletic performance. Despite these findings, there is still a lack of understanding of specific biomarkers to predict an athlete's fitness and ability to play their respective games. To address this knowledge gap, further research is needed to identify and validate specific biomarkers to accurately predict an athlete's fitness and ability to perform at their best in their respective sports. Thus, the rationale of this study aimed to identify specific biomarkers to predict an athlete's fitness and playing ability, which can help optimize training and improve performance.

Review of Literature

Non-invasive biomarkers have significant potential for predicting athletic performance by providing critical insights into various physiological and biochemical states without requiring invasive procedures. These biomarkers can be derived from multiple sources, including blood, saliva, sweat, and digital data. They can be used to monitor hydration status, cardiovascular health, musculoskeletal health, oxidative stress, and overall physical fitness. For instance, non-invasive sweat biomarkers, such as heart rate, core temperature, sweat sodium concentration, and whole-body sweat rate, have effectively predicted hydration status, which is crucial for maintaining performance during endurance exercises^[4]. Similarly, salivary biomarkers, including inflammatory markers and proteins, can be used to monitor the health and fitness of older adults, providing a non-invasive means to assess the impact of physical exercise on aging populations^[7]. In cardiovascular health, biomarkers such as troponins, myoglobin, CK-MB, NT-proBNP, and D-dimer are being explored for their potential to assess cardiovascular risk in athletes, which is essential for preventing adverse events such as sudden cardiac arrest^[2]. Integrating omics technologies, including genomics, transcriptomics, and metabolomics, further enhances the ability to predict athletic performance by offering a comprehensive view of an athlete's physiological state and predisposition to injuries or diseases^[6]. Machine learning models and deep learning methods are increasingly being applied to analyze these diverse datasets, enabling the prediction

of biomarkers and integration of multidimensional data for more accurate and personalized health monitoring^[8]. Athlete Biological Passport (ABP) exemplifies the application of longitudinal monitoring of biomarkers to detect doping and ensure fair play, with ongoing research aimed at improving its sensitivity and specificity through new biomarkers and machine learning approaches^[3]. Additionally, monitoring of oxidative stress biomarkers, such as the Free Oxygen Radical Test (FORT) and free oxygen radical deficiency (FORD), can help identify states of fatigue and underperformance, allowing for timely interventions to optimize training and recovery [10]. Combining conventional physical function tests with novel measures such as muscle mechanical properties and ultrasound imaging has also shown high discriminant ability in classifying healthy individuals and assessing musculoskeletal health, which is vital for designing effective training and rehabilitation programs^[5]. Overall, the use of noninvasive biomarkers in sports medicine and performance monitoring offers a promising avenue for enhancing athletic performance, preventing injuries, and promoting overall health and well-being in athletes^{[1][9]}. Furthermore, recent advancements in wearable technology have enabled the real-time monitoring of athletes' physiological parameters, providing valuable insights into their performance and recovery patterns. This real-time monitoring allows coaches and sports scientists to make data-driven decisions and adjustments to training programs, optimize performance, and reduce the risk of overtraining or injury. In the realm of sports medicine and performance optimization, wearable technologies have become indispensable tools for the real-time monitoring of athletes' physiological parameters during training sessions and competitions. These cutting-edge devices offer insights into hydration status, cardiovascular health, musculoskeletal health, oxidative stress, and overall physical fitness by collecting data from various sources, such as blood, saliva, sweat, and digital records. By leveraging wearable sensors embedded in athletic gear, coaches and sports scientists can access a wealth of information to tailor training programs, optimize recovery strategies, and make informed decisions regarding athletes' well-being and performance. The seamless integration of wearable technology with artificial intelligence algorithms has paved the way for personalized training regimes based on immediate data analysis, empowering athletes to reach their full potential while minimizing the risk of injuries or performance plateaus [11]. Furthermore, the real-time monitoring capabilities of wearable sensors allow for continuous tracking of key physiological parameters

during training sessions and competitions, enabling timely adjustments to optimize performance outcomes and prevent overtraining. Noninvasive biomarkers have become invaluable assets in sports medicine, offering crucial insights into athletes' physiological and biochemical states without invasive procedures. These biomarkers, sourced from the blood, sweat, saliva, and digital data, provide a comprehensive view of hydration levels, cardiovascular health, musculoskeletal well-being, oxidative stress, and overall physical fitness. By incorporating cutting-edge technologies, such as genomics, transcriptomics, and metabolomics, the predictive power of these biomarkers is significantly enhanced, enabling personalized health monitoring with precision. The integration of artificial intelligence algorithms further amplifies multidimensional data analysis, revolutionizing how coaches and athletes interpret information for performance optimization and injury prevention [12]. This advanced approach enhances athletic performance and facilitates early detection of potential health issues, allowing for timely interventions and tailored training programs to maximize athletes' career well-being and longevity.

Proposed Model for the Study

The model described as mind map titled "Potential Applications of Noninvasive Biomarkers in Athletic Performance" in figure 1 provides a structured overview of how various noninvasive biomarkers can be utilized to enhance and predict athletic performance. The map categorizes biomarkers into three main types: physiological (e.g., heart rate, blood pressure, respiratory rate), biochemical (e.g., hormones, metabolites, enzymes), and genetic (e.g., SNPs, gene expression). These biomarkers are critical in several applications, including performance prediction, health monitoring, and personalized training. Performance prediction encompasses training optimization, injury prevention, and recovery monitoring. Health monitoring includes early detection of overtraining and chronic disease prevention. Personalized training covers tailored training programs and nutritional guidance. Additionally, the map outlines essential performance metrics like speed, endurance, strength, and flexibility. Data collection methods are also highlighted, with wearable devices (e.g., smartwatches, fitness trackers) and mobile apps (e.g., health monitoring apps, fitness apps) playing a significant role. This comprehensive model underscores the potential of integrating noninvasive biomarkers in developing sophisticated, data-driven approaches to improving athletic performance and overall health.



Figure 1: Proposed model for potential applications of using noninvasive biomarkers to predict athletic performance.

The integration of noninvasive biomarkers in athletic performance not only facilitates the assessment and enhancement of an athlete’s physical capabilities but also provides valuable insights into their health and well-

being. By monitoring physiological markers such as heart rate and blood pressure, coaches and sports scientists can tailor training regimens to optimize performance while minimizing the risk of injury. Biochemical markers,

including hormone levels and metabolite concentrations, offer a deeper understanding of an athlete's metabolic state and recovery needs, enabling more precise interventions.

Genetic biomarkers, such as single nucleotide polymorphisms (SNPs) and gene expression profiles, contribute to personalized training plans by identifying genetic predispositions that may influence an athlete's performance and susceptibility to certain conditions. These insights allow for customized nutritional guidance and training programs that align with an athlete's unique genetic makeup.

The use of performance metrics like speed, endurance, strength, and flexibility provides a comprehensive evaluation of an athlete's progress and areas for improvement. These metrics, when correlated with biomarker data, can reveal patterns and trends that inform future training strategies.

The advent of wearable devices and mobile applications has revolutionized data collection, making it more accessible and continuous. Smartwatches and fitness trackers enable real-time monitoring of vital signs and activity levels, while health monitoring and fitness apps provide platforms for tracking and analyzing data over time. This continuous data flow supports dynamic adjustments to training and recovery protocols, ensuring that athletes maintain optimal performance and health.

In summary, the potential applications of noninvasive biomarkers in predicting and enhancing athletic performance are vast and multifaceted. By leveraging physiological, biochemical, and genetic data, and employing advanced data collection technologies, athletes and their support teams can achieve a higher level of precision in training, injury prevention, and overall health management. This holistic approach not only boosts athletic performance but also contributes to the long-term well-being of athletes.

Discussion with Opposing Views

Some critics argue that relying solely on non-invasive biomarkers and wearable technology for predicting athletic performance may overlook the importance of individual variability and subjective factors that can significantly impact an athlete's capabilities. Although these tools offer valuable insights into physiological and biochemical states, they may not capture the full complexity of human performance, which can be influenced by psychological factors, motivation, and external variables that are not easily quantifiable. Additionally, there are concerns

about the reliability and accuracy of certain biomarkers, as variations in measurement techniques, environmental conditions, and individual differences can affect the interpretation of the results. Critics have also questioned the potential overreliance on artificial intelligence and machine learning algorithms in sports medicine, highlighting the limitations of these technologies in accounting for nuances and context-specific factors that play a crucial role in athletic performance. Moreover, there are ethical considerations surrounding the use of AI in predicting injury risks because preemptive adjustments to training regimens based on algorithmic predictions may raise concerns about privacy, autonomy, and the potential for unintended consequences. Critics emphasize the importance of maintaining a holistic approach to sports medicine that considers the individual athlete's needs, preferences, and feedback, rather than relying solely on data-driven insights from noninvasive biomarkers and wearable technology.

Conclusion

Integrating non-invasive biomarkers, wearable technology, and artificial intelligence in sports medicine holds immense promise for enhancing athletic performance, preventing injuries, and promoting overall well-being in athletes. By leveraging advancements in genomics, metabolomics, and machine learning, these tools enable personalized health monitoring and real-time data analysis, thereby providing valuable insights for optimizing training programs and recovery strategies. The seamless integration of wearable sensors and AI algorithms allows for proactive adjustments to training regimens, reducing the risk of setbacks, and maximizing athletic potential. This data-driven approach revolutionizes the way athletes optimize their training routines and tailor their recovery strategies, ultimately leading to enhanced performance outcomes and improved well-being.

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